



### The 4<sup>th</sup> ISDE International Lectures

Local Earth Observation Data Cubes for the Digital Earth Vision May 23, 2023

# The Austrian semantic Earth observation data cube - Sen2Cube.at

### A research idea becomes a national-wide data cube implementation

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## Motivation: Big EO Data





## Changes in workflows



From: Sudmanns, M., Tiede, D., Lang, S., Bergstedt, H., Trost, G., Augustin, H., Baraldi, A., Blaschke, T., 2019. Big Earth data: disruptive changes in Earth observation data management and analysis? Int. J. Digit. Earth 0, 1–19. <u>https://doi.org/10.1080/17538947.2019.1585976</u>

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# Big EO Data Analysis Platforms

- Big EO data analysis platforms: Often provided by large companies or large research institutions, including collections of PBs of open access data
- Ease of use of pre-configured platforms, with no need to consider difficult data structures, software and hardware requirements

BUT:

- The dependency on a specific platform, its data and functionalities, and generally the loss of control may limit the diversity of users, limiting R&D and the sustainability of business models
- We argue for the additional possibility of 'local' solutions to use and contribute to big EO data analytics, enable new (different) analyses and product development, otherwise not possible with large-scale systems

Sudmanns, M., Augustin, H., Killough, B., Giuliani, G., Tiede, D., Leith, A.,
Yuan, F., Lewis, A., 2022. Think global, cube local: an Earth Observation
Data Cube's contribution to the Digital Earth vision. Big Earth Data 00, 1–
29. <u>https://doi.org/10.1080/20964471.2022.2099236</u>





entinelh

Microsoft Planetary Computer





### Our approach

### Our approach....

- Make Earth observation (EO) data easier accessible & allow cloud-based analyses of TBs of data (if possible programming free)
- Designing/creating and upscaling our own developed analysis approach for big EO data: semantic EO data cubes
- Tackle new research topics that require big data processing e.g., around SDGs
- Requirements:
  - Access to computing, storage and big EO data resources and the data management (at least in proof-of-concept size).
  - Flexible/adaptable software
  - Own developments on top
  - → Possibility to create our own cloud service for big EO data analysis
    - ... implemented by a small team(5 + students)

### Definition of a semantic EO data cube

"A semantic EO data cube or a semantics-enabled EO data cube is a data cube, where for each observation at least one nominal (i.e., categorical) interpretation is available and can be queried in the same instance"

 Different data cube software possible; here: Open Data Cube Temporally stacked EO images (+other geodata), either as **view** or as **physical data structure**. Usually coupled with **analysis-ready data** (ARD). Main goal: Abstracting data storage from users

We go beyond ARD – starting from semantically enriched data allows programming free access, and an even higher abstraction of data storage from user access

Augustin, H., Sudmanns, M., Tiede, D., Lang, S., Baraldi, A., 2019. Semantic Earth Observation Data Cubes. Data 4, 102. <u>https://doi.org/10.3390/data4030102</u>



## Key components of a semantic EO data cube

2 Data cube technology: User-defined areas-ofinterests and time intervals



1 Images: All images (here: Sentinel-2), every pixel semantically enriched (fully automated, no training samples)

+ additional (open) datasets (e.g. DEM)

3 Web-based inference engine: High-level semantic querying

Tiede, Dirk; Baraldi, Andrea; Sudmanns, Martin; Belgiu, Mariana; Lang, Stefan (2017): Architecture and prototypical implementation of a semantic querying system for big Earth observation image bases. In European journal of remote sensing 50 (1), pp. 452–463. DOI: 10.1080/22797254.2017.1357432





### Every (optical) EO image has a semantic skin/layer:

- Reflectance values are associated to spectral categories
- Transferrable between sensors
- Time series of spectral categories are the basis for on-demand semantic queries

## 1 Semantic enrichment

### SIAM (Satellite Image Automatic Mapper) "multi-spectral colour naming"

- Fully automated, based on a physical model
- No parameter, no training-samples
- Near real-time (< 5 min. for a Sentinel-2 granule)</li>
- Scalable, parallelisable in Docker containers
- Multi-sensor support (at least TOA calibration)

### Cross-sensor SIAM<sup>™</sup> - granularity map, 33 Spectral categories





Baraldi, A., Sapia, L. D., Tiede, D., Sudmanns, M., Augustin, H. L., & Lang, S. (2022). Innovative Analysis Ready Data (ARD) product and process requirements, s oftware system design, algorithms and implementation at the midstream as necessary-but-not-sufficient precondition of the downstream in a new notion of Space Economy 4.0 - Part 1: Problem background in Artificial GeneralIntelligence (AGI). Big Earth Data, 1-239. https://doi.org/10.1080/20964471.2021.2017549

# SIAM spectral categorization

Sentinel-2 scene (Austrian/German border) 27 August 2016

Kilometers

20

## SIAM spectral categorization

Kilometers

40

20

0

5

10

30

96 spectral categories (Austrian/German border) 27 August 2016



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### Input:

Optical EO images, at least top-of-atmosphere calibrated

Method: Hybrid bottom-up semantic enrichment + top-down semantic querying approach

Output: Maps, time series, .



Worldwide applicable semantic enrichment in different granularities Application-<br/>agnostic,<br/>genericWeb-based<br/>graphical inference<br/>engine andShared<br/>knowledgebase<br/>containing<br/>semantic<br/>language

ry Deep water or shadow

Define a water entity based on appearance

using count. The result is a map indicatir for every pixel the occurrence of water

entity water

count

of SIAM categorie

SCBIR

Time series analysis

Com-

posites

3



- An inference engine for semantic querying as a Web interface in a client-server solution.
- Different and multiple output types are possible and depending on the query.
- Generic Web interface: access to different semantic EO data cubes possible
- Create, save and share semantic queries in a knowledgebase
- Open Source code: https://github.com/zgis/semantique

Sudmanns, M., Augustin, H., Van Der Meer, L., Werner, C., Baraldi, A., & Tiede, D. (2021). One GUI to rule them all: Accessing multiple semantic EO data cubes in one graphical user interface. GI\_Forum, 9(1), 53-59. https://doi.org/10.1553/GISCIENCE2021\_01\_S53

Van der Meer, L., Sudmanns, M., Augustin, H., Baraldi, A., & Tiede, D. (2022). Semantic querying in Earth observation data cubes. International Archives of the Photogrammetry, Remote Sensing and Spatial Information Sciences - ISPRS Archives, XLVIII-4/W1-2022, 503-510. <u>https://doi.org/10.5194/isprs-archives-XLVIII-4-W1-2022-503-2022</u>



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3 High-level semantic guerying

- Bridging image domain and semantic domain
- Conceptually, the two domains are separated from each other
- Implementation is Python-based and data-cube-software agnostic (our data cube class: OpenDataCube)



Van der Meer, L., Sudmanns, M., Augustin, H., Baraldi, A., & Tiede, D. (2022). Semantic querying in Earth observation data cubes. International Archives of the Photogrammetry, Remote Sensing and Spatial Information Sciences - ISPRS Archives, XLVIII-4/W1-2022, 503-510. https://doi.org/10.5194/isprs-archives-XLVIII-4-W1-2022-503-2022

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### Example: How green is Austria?

Entities Partitions Results Appearano Atmosphere

Reflectance Topography Artifacts

Metadata Combiners Verbs. Chains

Values Groups

### **National-wide information-layers**

Percent of vegetation observations between March and September 2020 (without clouds) for entire Austria





Sudmanns, M., Augustin, H., van der Meer, L., Baraldi, A., & Tiede, D. (2021). The Austrian semantic EO data cube infrastructure. Remote Sensing, 13(23), 4807. https://doi.org/10.3390/rs13234807



## Showcasing applications





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## Architecture

- scalable, container-based architecture
- Horizontal scaling
- Concurrent multi-user access
- A layout describes the semantic EO data cube's content
- multiple clients supported through an API





## Clients and interfaces

The semantic EO data cube architecture allows:

- Executing semantic models in the cloud via standard JSON API on-demand in the cloud
- Earth observation data can be easily integrated in existing software/clients







Nature`s Calendar citzen science app



- EO data cubes can have a significant local impact
- Adding own datasets
- Extending as midstream technology
- Make use of local knowledge and integrate communities
- Main challenge: Interoperability and transferability



Can we have a local impact?





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